

# Measurement of Energy-dependent Inclusive Muon Neutrino Charged-Current Cross Section at MicroBooNE

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For the MicroBooNE collaboration

Brookhaven Forum, Nov 4<sup>th</sup> 2021

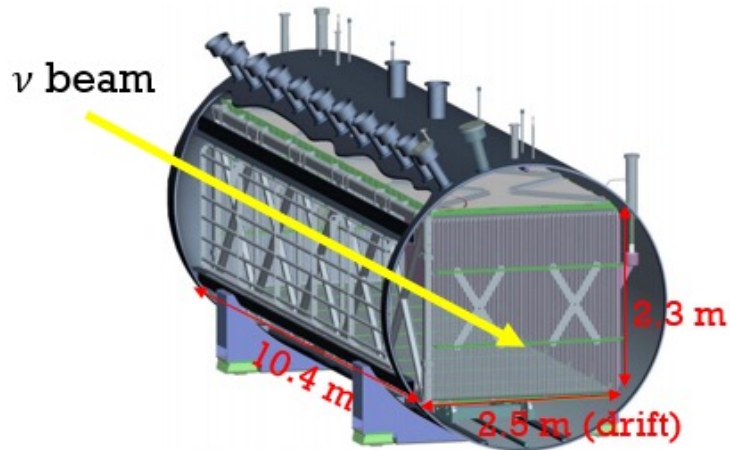
# MicroBooNE Overview

- Micro Booster Neutrino Experiment

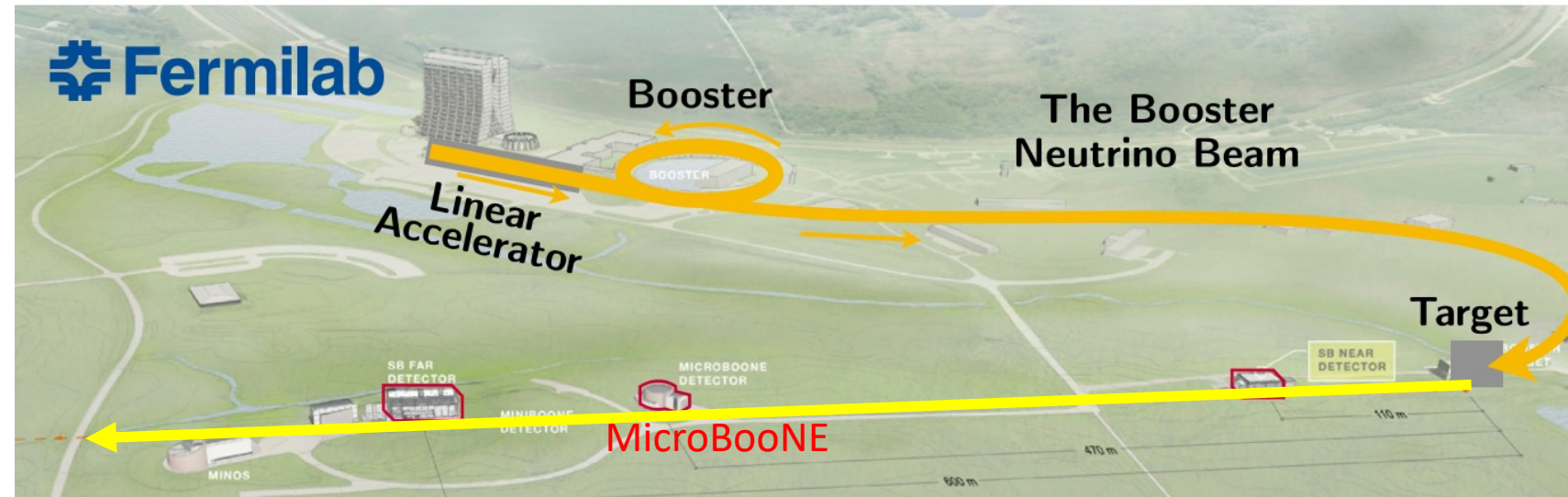
- Accelerator  $\nu$  experiment at Fermilab
- LArTPC with 85 ton active mass
- Near-surface operation

- Main physics goals:

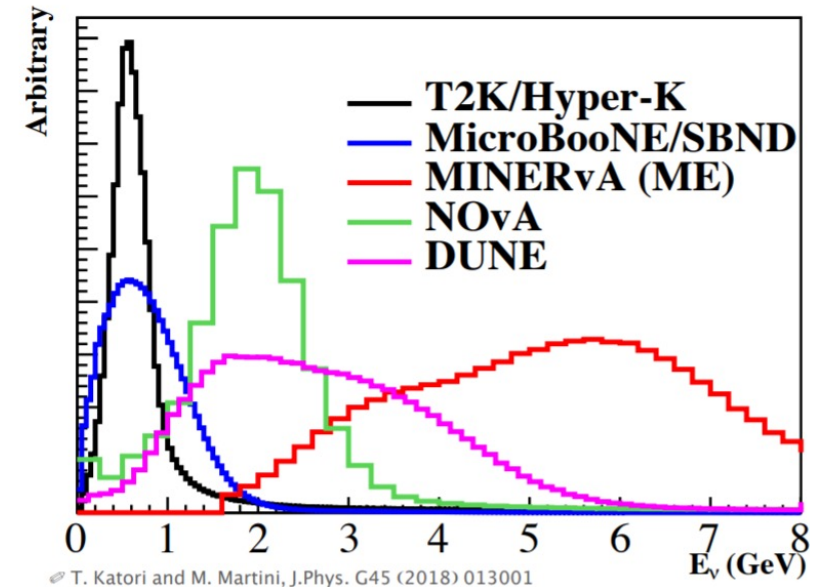
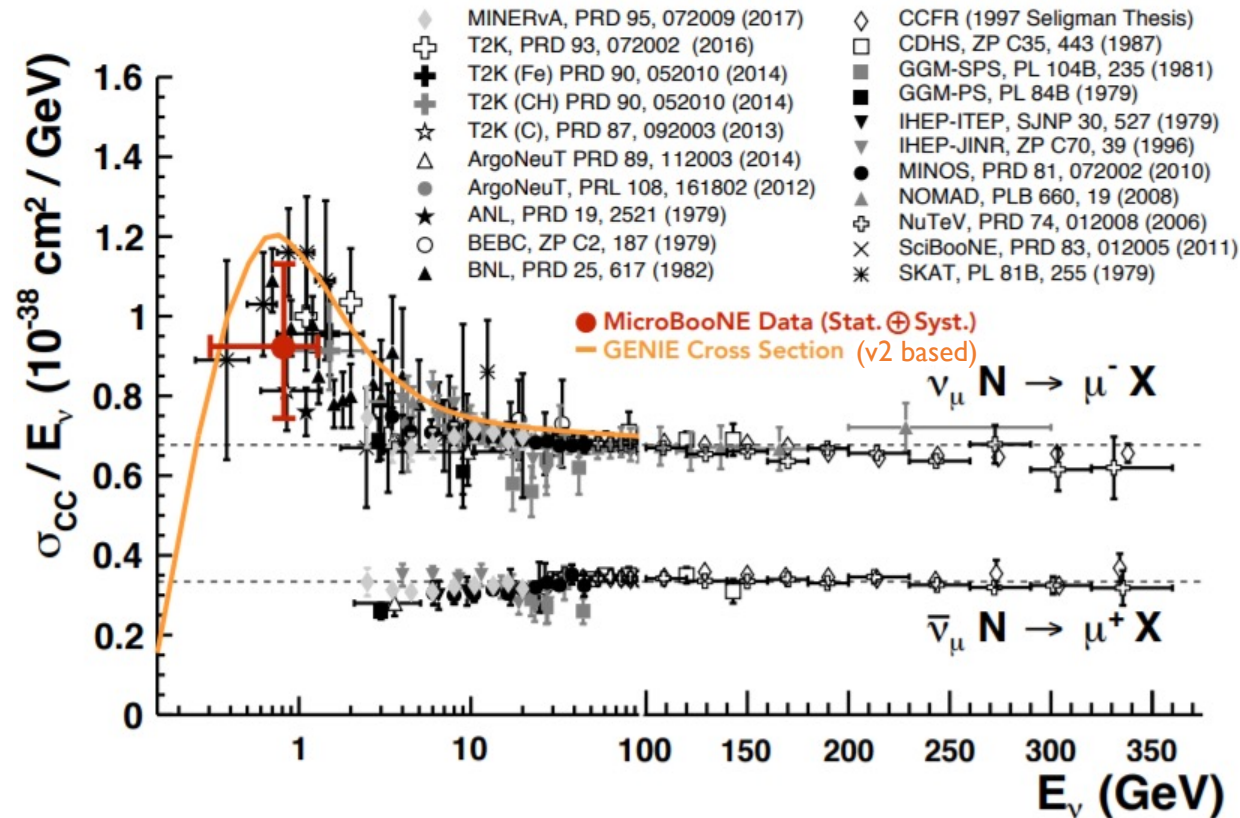
- Investigate MiniBooNE low-energy excess (plenary session II this morning, by Bonnie F.)
- Measure  $\nu$ -Ar interaction cross-sections



MicroBooNE detector



# Measurements of Inclusive $\nu_\mu$ Charged-Current (CC) Cross Section

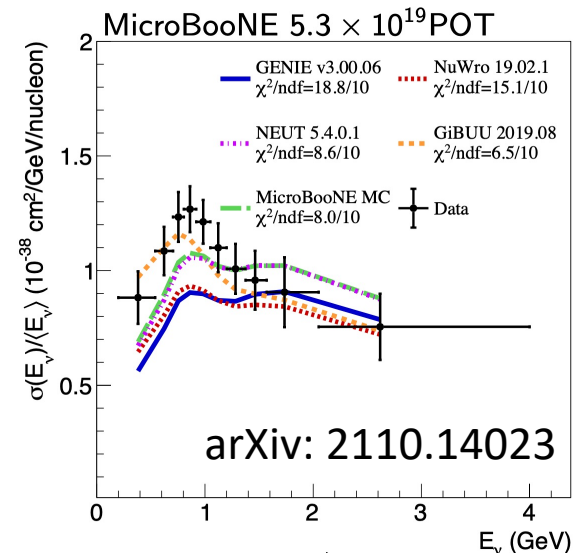
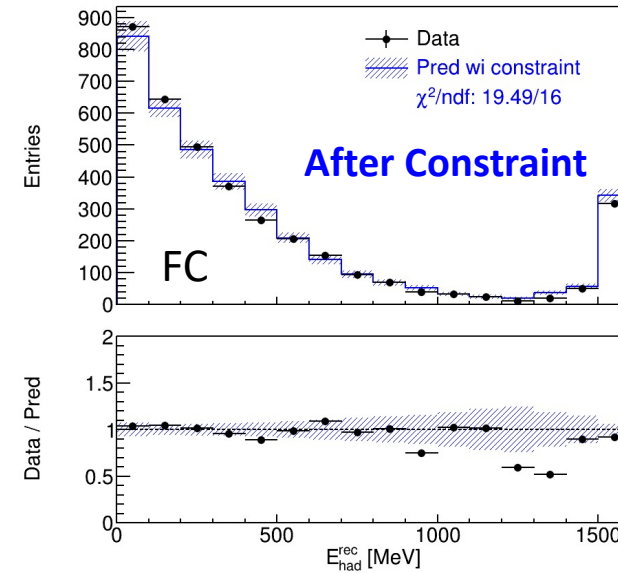


Review of Particle Physics  
PDG, PTEP 2020 (2020) 8, 083C01

- One of the most important systematics for precision accelerator neutrino oscillation measurement
- **Energy-dependent** inclusive cross section is a good test of overall modeling of all the interaction processes, and form a good basis for the study of various exclusive interaction processes

# Highlights in This Talk

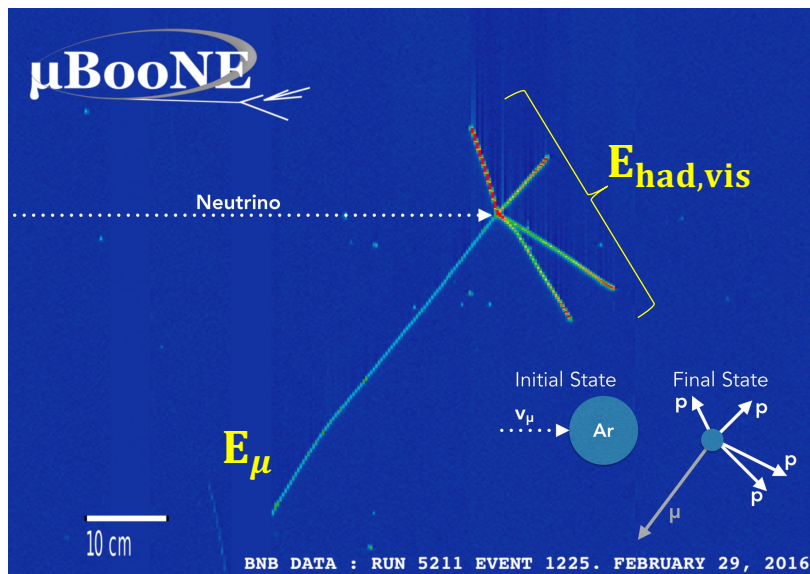
- Stringent model validation for hadronic missing energy performed with a formalism of conditional constraint
- Measurement of energy-dependent inclusive  $\nu_\mu$  CC cross section





# Energy Model Validation: True $E_\nu$ to $E_\nu^{rec}$

- Neutrino energy modeling is also critical for neutrino oscillation measurements
- Key challenge: verify the modeling of the undetectable missing hadronic energy



True energy components:

$$E_\nu = E_\mu + E_{had,vis} + E_{had,missing}$$

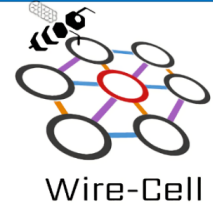
Calorimetric energy reconstruction:

$$E_\nu^{rec} = E_\mu^{rec} + E_{had,vis}^{rec}$$

- We overcome this challenge leveraging LArTPC's simultaneous measurements of lepton energy and visible hadronic energy
  - We measure two differential cross sections ( $d\sigma/dE_\mu$ ,  $d\sigma/d\nu$ ) in addition to the total cross section  $\sigma(E_\nu)$

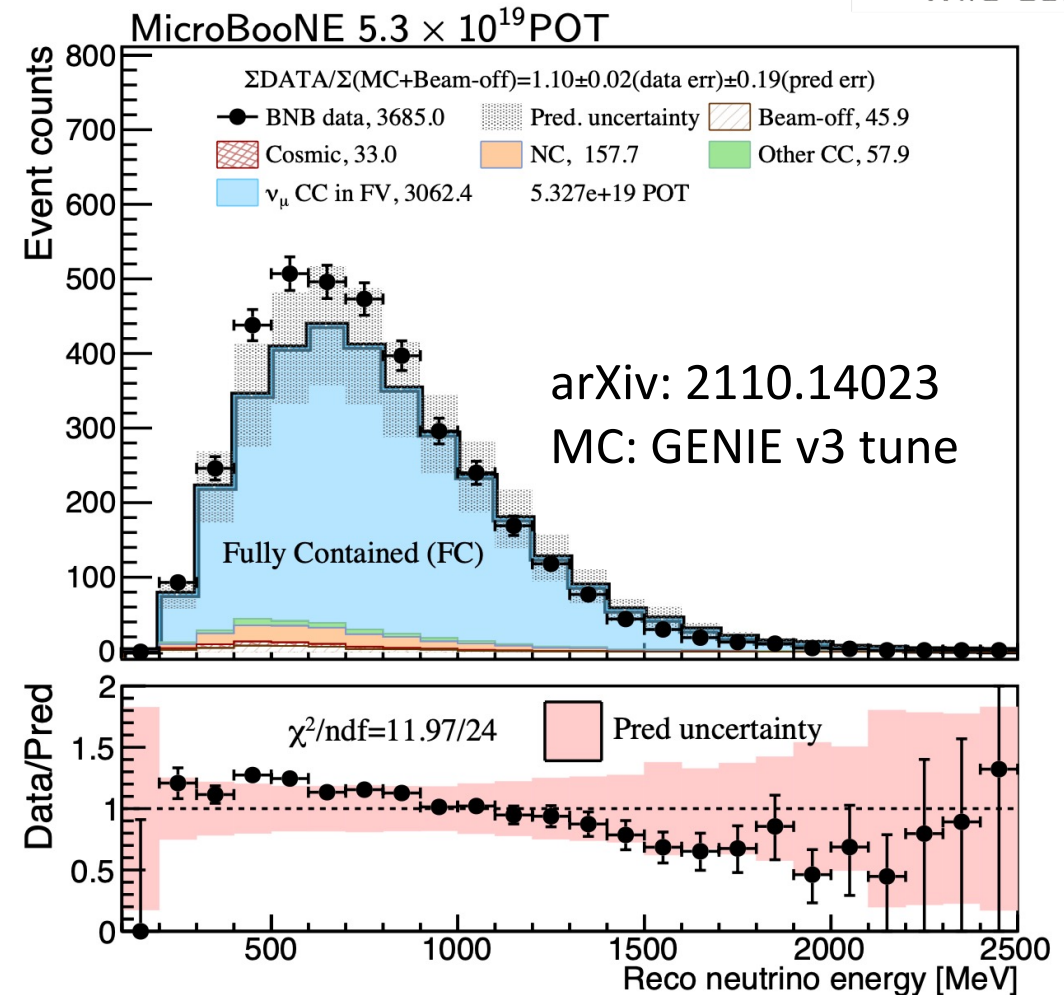
# Verify the modeling of the missing hadronic energy at MicroBooNE

# Selection of Inclusive Charged-Current $\nu_\mu$ Interactions



	Efficiency	Purity	Cosmic- $\mu$ rejection
Trigger	1	5e-5	1
Generic- $\nu$ detection	80%	65%	7e-6
<b><math>\nu_\mu</math> CC</b> (Fully & Partially Contained)	<b>68%</b>	<b>92%</b>	7e-7

- Achieved excellent cosmic- $\mu$  rejection
  - Wire-Cell reconstruction: JINST 16 (2021) 06, P06043
  - Generic- $\nu$  detection:
    - arXiv:2012.07928, Phys. Rev. Applied 15, 064071 (2021)
- The **high-statistics** event selection allows for high-precision/multi-dimensional cross-section measurements



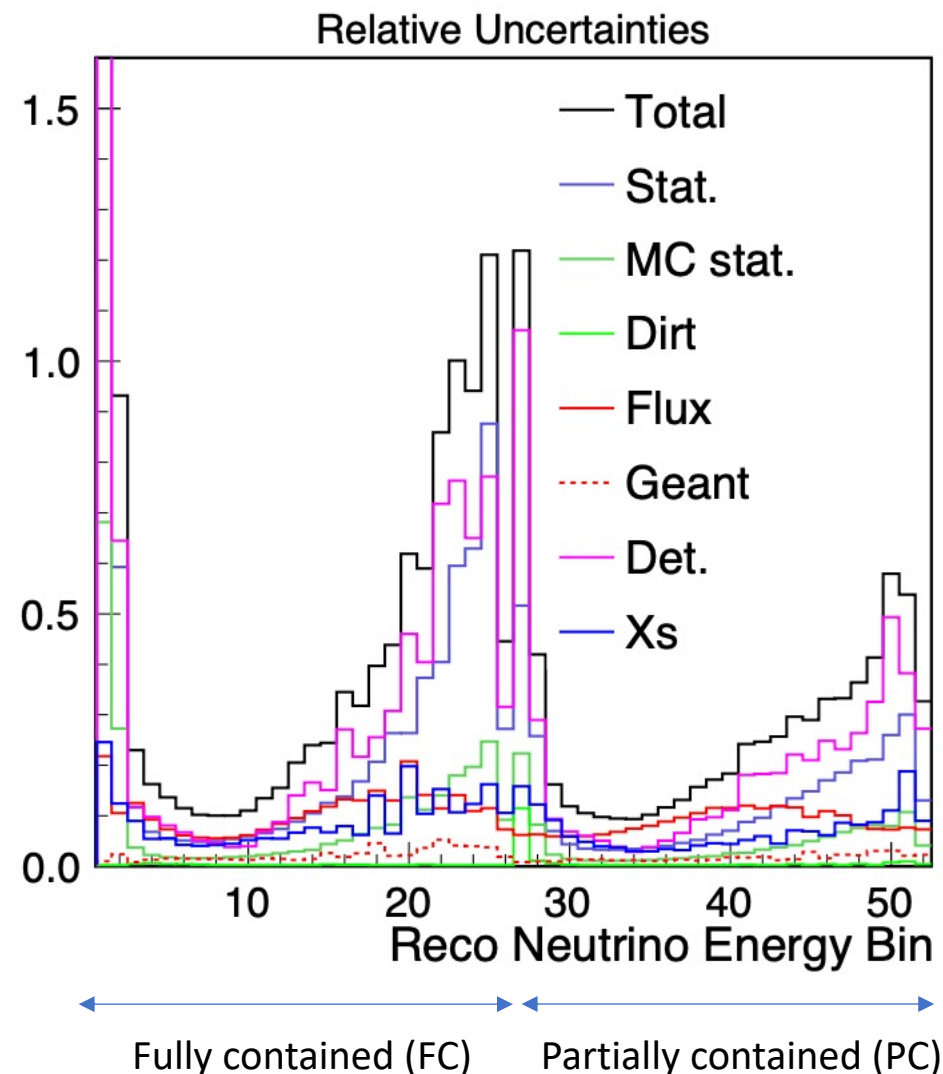
Calorimetric energy:

$$E_v^{\text{rec}} = E_\mu^{\text{rec}} + E_{\text{had}}^{\text{rec}}$$



# Systematic Uncertainties

- BNB neutrino flux uncertainty
  - MiniBooNE: [Phys. Rev. D79, 072002](#)
- Neutrino cross section uncertainty
  - GENIE-v3 with the MicroBooNE tune: [arXiv:2110.14028](#)
- Detector systematics
  - TPC, Light, Space Charge, Recombination
  - Bootstrapping approach
- Hadron-argon interaction uncertainty
  - GEANT4 reweight
- MC statistical uncertainty
  - Bayesian approach
- Dirt systematics
  - Materials outside the cryostat



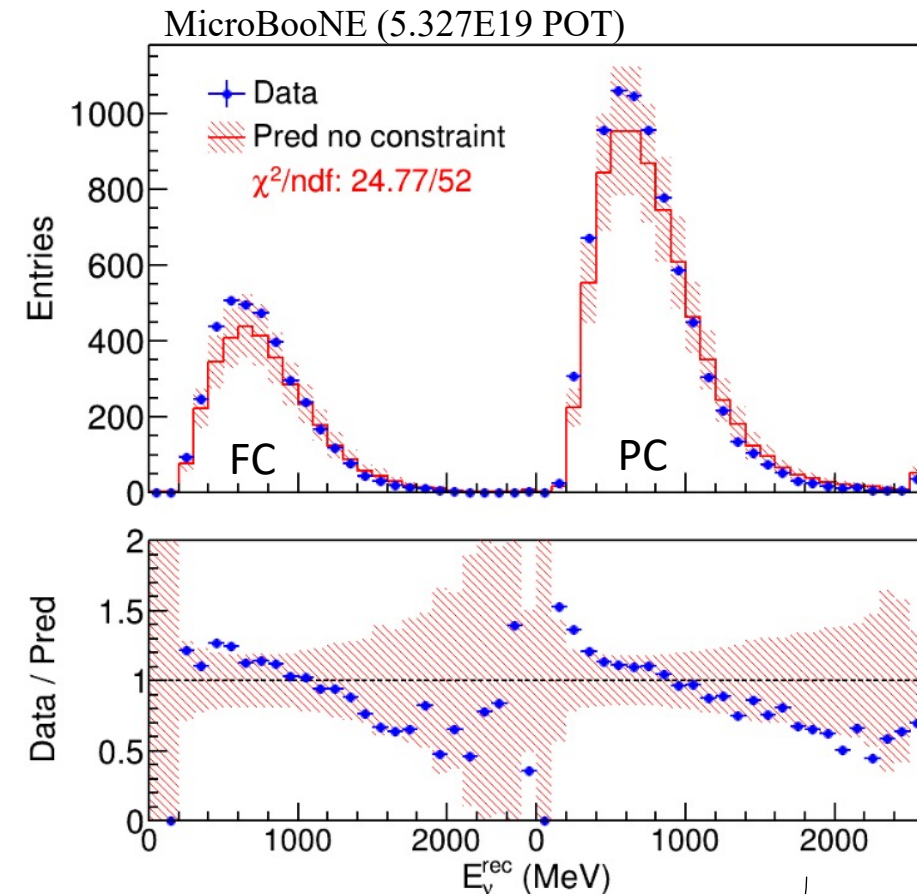


# Model Validation: Goodness-of-Fit (GoF)

- A covariance matrix is built from the full systematics (flux, Xs, detector, MC statistics) and statistics

$$\chi^2 = (M - P)^T \times Cov_{full}^{-1}(M, P) \times (M - P)$$

- $\chi^2/ndf$ : goodness-of-fit for the overall model
- A reasonable GoF of  $\mathbf{E}_\nu^{rec}$  indicates data-MC difference can be well covered by systematics
- Overestimation of part of uncertainties could hide the potential bias in other part
  - ▶ This can be solved with conditional covariance formalism



Calorimetric energy:

$$E_\nu^{rec} = E_\mu^{rec} + E_{had}^{rec}$$

# Conditional expectation & covariance

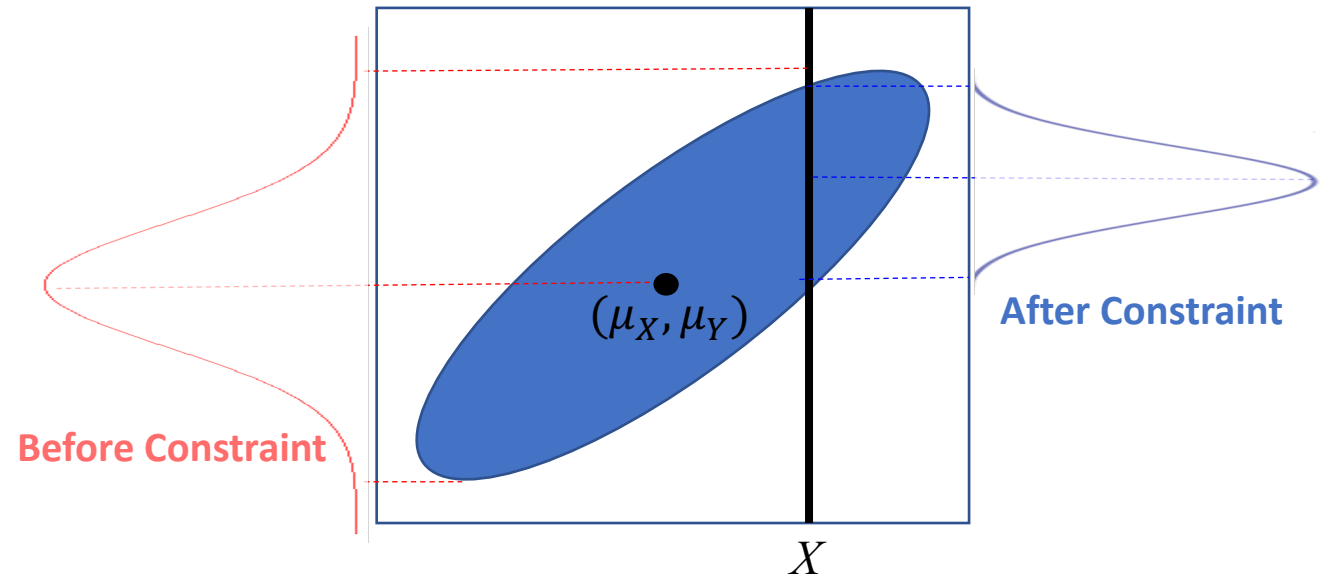
## Conditional expectation & covariance

$$\mu_{X,Y} = \begin{pmatrix} \mu_X \\ \mu_Y \end{pmatrix}, \quad \Sigma_{X,Y} = \begin{pmatrix} \Sigma_{XX} & \Sigma_{XY} \\ \Sigma_{YX} & \Sigma_{YY} \end{pmatrix}$$

$$\mu_{Y|X} = \mu_Y + \Sigma_{YX}\Sigma_{XX}^{-1}(X - \mu_X)$$

$$\Sigma_{Y|X} = \Sigma_{YY} - \Sigma_{YX}\Sigma_{XX}^{-1}\Sigma_{XY}$$

\* A variant of Gaussian Process regression

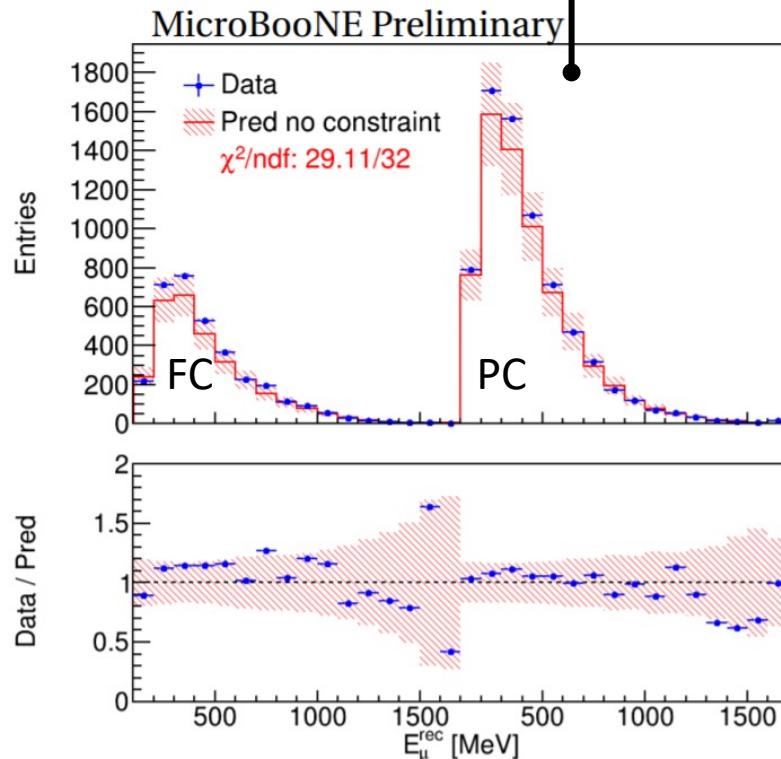


- In-situ model correction on both mean ( $\mu$ ) and covariance ( $\Sigma$ ) with “sideband”
- Avoid over-tuning of MC model (flux, cross section, reinteraction, etc.)
- **For example,  $\mu(E_{had}^{rec} | E_{\mu}^{rec})$  and  $\Sigma(E_{had}^{rec} | E_{\mu}^{rec})$  are the mean and covariance of  $E_{had}^{rec}$  distribution after constraint to  $E_{\mu}^{rec}$  distribution**
  - Reduce common systematics
  - Estimate correlated statistical uncertainty with bootstrapping (sampling w/ replacement)

# Model Validation: $M(\mathbf{E}_\mu^{\text{rec}})$ vs. $\mu(\mathbf{E}_\mu^{\text{rec}})$

- LArTPC can separate lepton and hadronic energy from charged-current interactions

$$E_\nu = E_\mu + E_{\text{had,vis}} + E_{\text{had,missing}}$$



**FC:** fully-contained events in the fiducial volume (FV)

**PC:** partially contained events in the FV

**Goodness-of-fit test:**

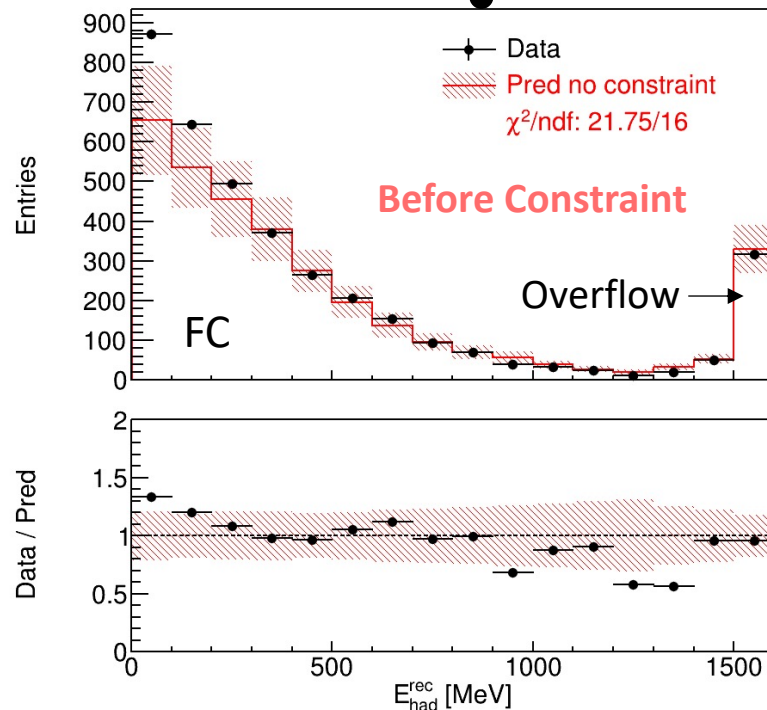
$$\chi^2 = (M - \mu)^\top \cdot \Sigma^{-1} \cdot (M - \mu)$$

- Good agreement within model uncertainty given that  $\chi^2/\text{ndf} = 29.11/32$

# Model Validation: $M(\mathbf{E}_{\text{had}}^{\text{rec}})$ vs. $\mu(\mathbf{E}_{\text{had}}^{\text{rec}})$

- LArTPC can separate lepton and hadronic energy from charged-current interactions

$$E_{\nu} = E_{\mu} + E_{\text{had,vis}} + E_{\text{had,missing}}$$



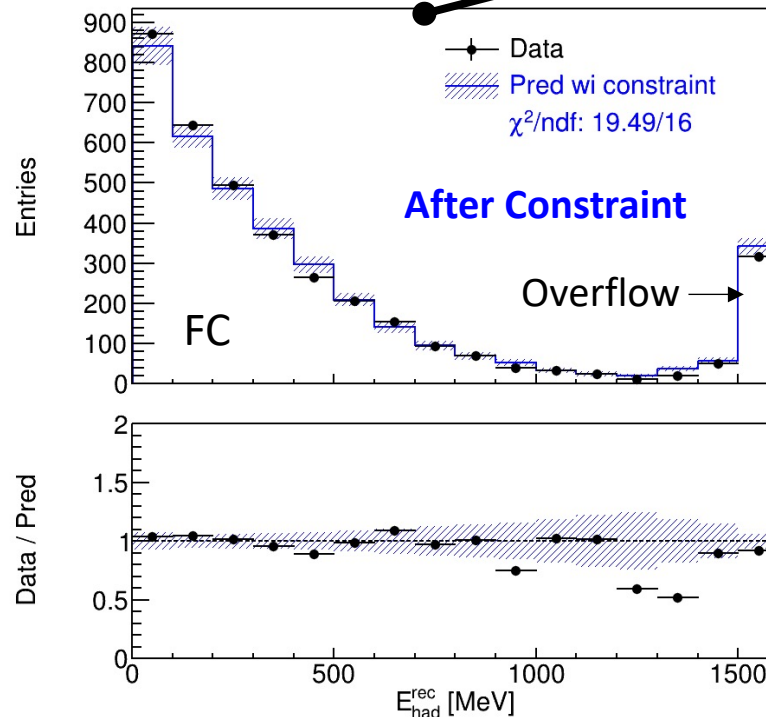
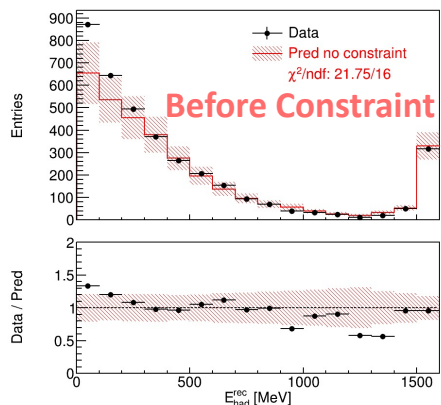
- Excess at low hadronic energy
- Mis-modeling of hadronic missing energy given neutrino flux reasonably well known?
- $\chi^2/\text{ndf}$  is reasonable but large uncertainty could hide the potential bias

Solution: lepton-side measurement can be used to constrain the overall model (flux, cross section, etc.)

# Model Validation: $M(\mathbf{E}_{\text{had}}^{\text{rec}})$ vs. $\mu(\mathbf{E}_{\text{had}}^{\text{rec}} \mid \mathbf{E}_{\mu}^{\text{rec}}, \cos\theta_{\mu}^{\text{rec}}, E_{\nu})$

- LArTPC can separate lepton and hadronic energy from charged-current interactions

$$E_{\nu} = E_{\mu} + E_{\text{had,vis}} + E_{\text{had,missing}}$$

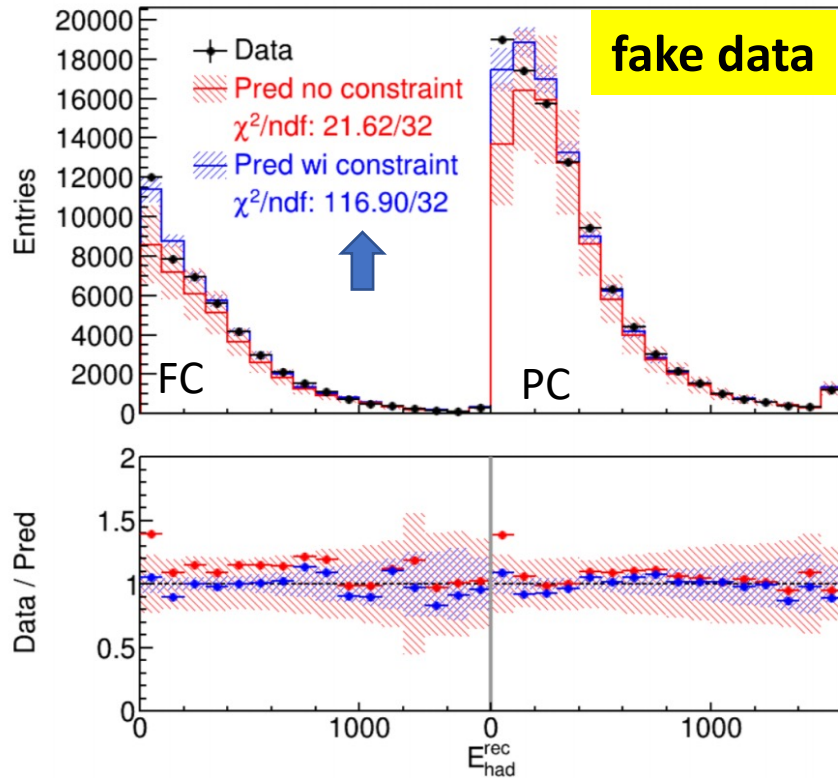


Measured muon kinematics are used to constrain the overall model (flux, cross section, etc.) for hadronic energy

- Significant reduction in overall systematic uncertainties (20%  $\rightarrow$  5%)
- No more excess at low hadronic energy with constraints from muon
- No sign of mis-modeling of the hadronic missing energy



# Is the new method really working?



- Fake data (GENIE v2) shows a poor  $\chi^2/ndf$  for  $E_{had}^{rec}$  after constraint to muon kinematics

$E_p^{rec}$ scaling factor	FC events (ndf=16)	PC events (ndf=16)	FC+PC (ndf=32)
0.95	2.55 (1.00)	4.08 (1.00)	5.34 (1.00)
0.90	8.90 (0.92)	17.13 (0.38)	21.05 (0.93)
0.85	18.66 (0.29)	39.45 (0.00)	47.01 (0.04)
0.80	32.95 (0.01)	67.88 (0.00)	80.60 (0.00)

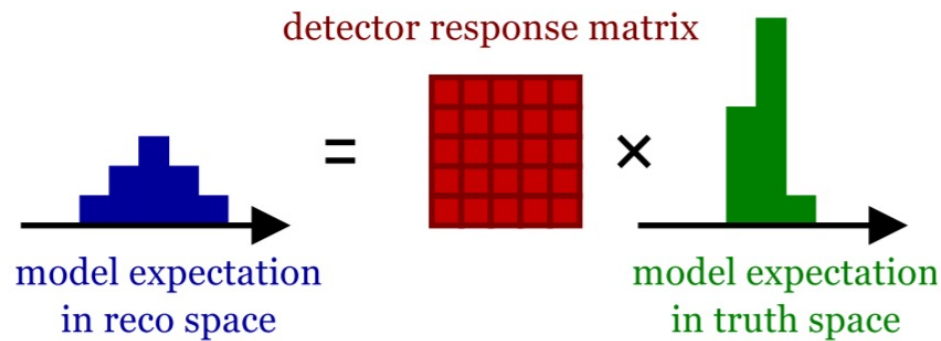
- $\chi^2/ndf$  has a significant increase with a shift of  $\sim 15\%$  in the hadronic energy fraction allocated to protons (mimicking a variation of the proton-inelastic cross section)

**The conditional constraint approach is sensitive to the underlying model difference**

# Cross Section Unfolding

# Towards $\sigma(E)$ with Unfolding

- Understanding the cross section as a function of energy,  $\sigma(E)$ , is crucial for oscillation measurements
- We measure  $\sigma(E)$  using Wiener-SVD unfolding [JINST, 12, P10002 (2017)]
  - Simplify procedure and maximize S/N ratio



$$M_i = \sum_j R_{ij} \cdot S_j + B_i$$

$i$ : bin in  $E_{rec}$   
 $j$ : bin in  $E_\nu$

\* Covariance matrices are added to the measurement bin  $M_i$  through  $R_{ij}, B_i$

# Cross Section Extraction

Measurements

Flux

Cross section

Detector response

Selection  
efficiency

Background

$$M(E_{rec}) = POT \cdot T \cdot \int F(E_\nu) \cdot \sigma(E_\nu) \cdot D(E_\nu, E_{rec}) \cdot \varepsilon(E_\nu, E_{rec}) \cdot dE_\nu + B(E_{rec})$$

**Refactorized**

$$M_i = \sum_j R_{ij} \cdot S_j + B_i$$

MicroBooNE's nominal MC (GENIE v3 tune)  
is used to determine  $R_{ij}$

# Cross Section Extraction

Measurements



Flux



Cross section



Detector response



Selection efficiency



Background



$$M(E_{rec}) = POT \cdot T \cdot \int F(E_\nu) \cdot \sigma(E_\nu) \cdot D(E_\nu, E_{rec}) \cdot \epsilon(E_\nu, E_{rec}) \cdot dE_\nu + B(E_{rec})$$



**Refactorized**

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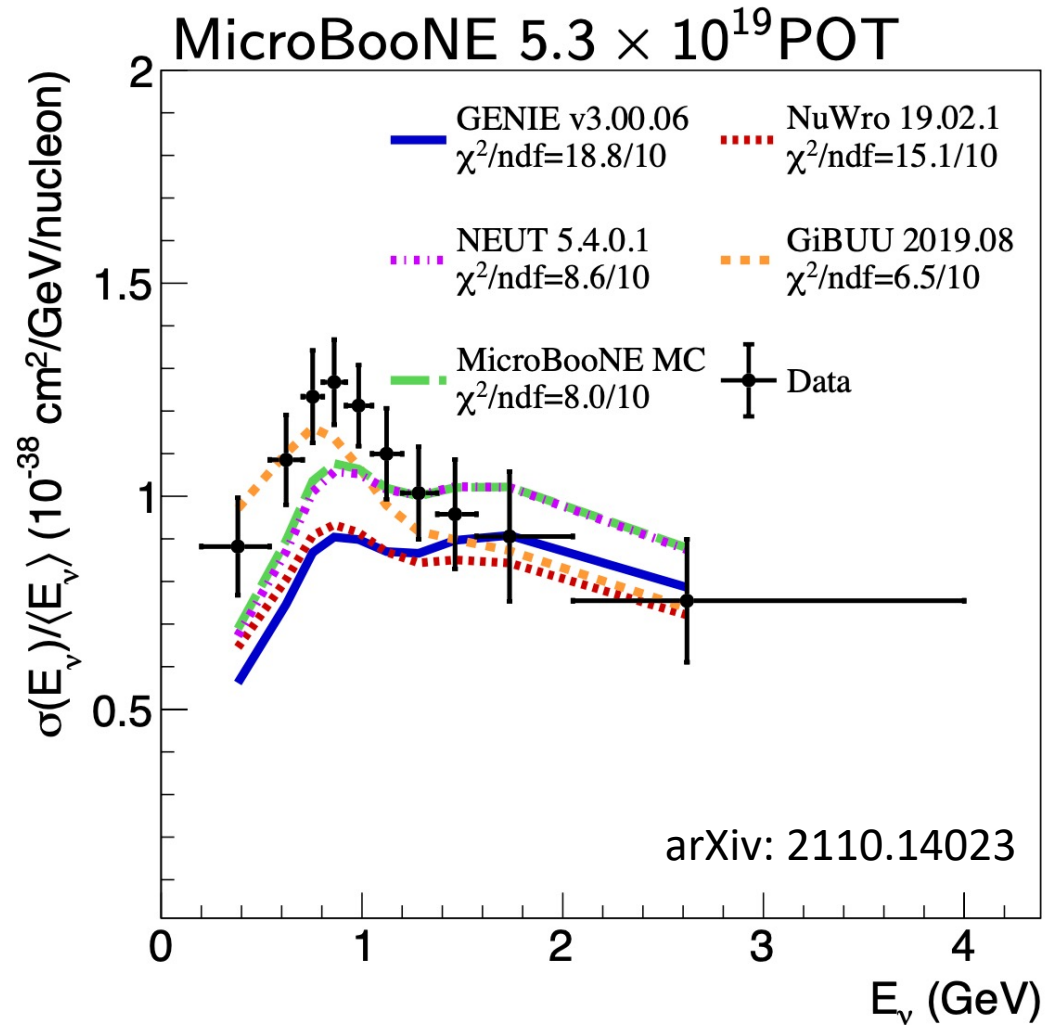
$$S_j = \frac{\int_j \bar{F}(E_{\nu j}) \cdot \sigma(E_{\nu j}) \cdot dE_{\nu j}}{\int_j \bar{F}(E_{\nu j}) \cdot dE_{\nu j}}$$

**Nominal-flux averaged cross section**

\* Proper treatment of flux shape uncertainty:  
PhysRevD.102.113012



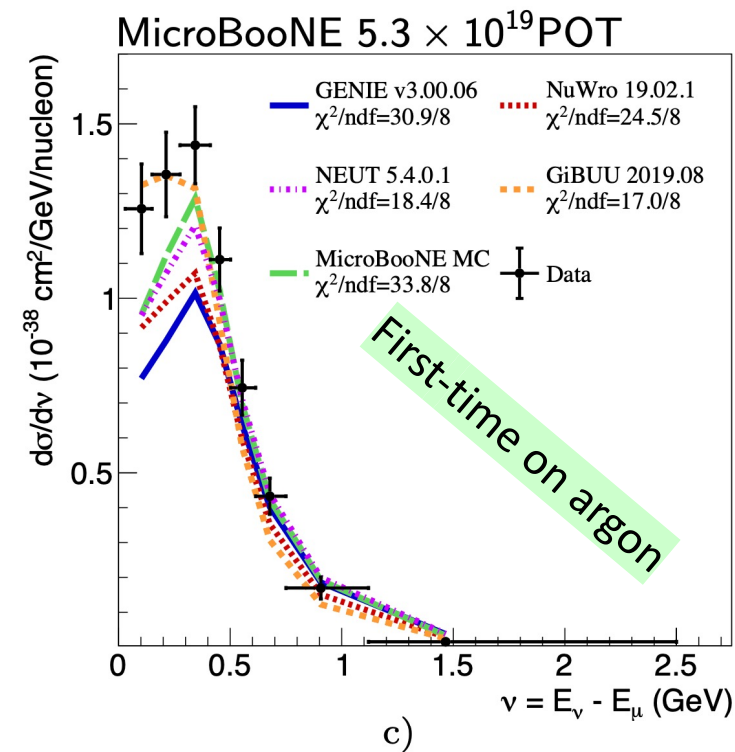
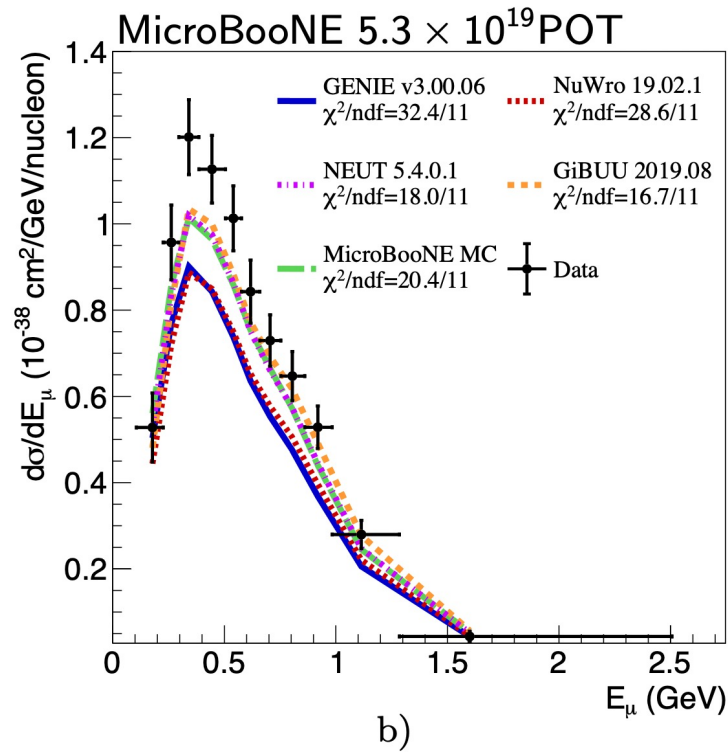
# Result (I): Total Cross Section $\sigma(E)$



- Wiener regularization applied to each generator's model prediction for a proper data comparison
- GiBUU, NEUT and MicroBooNE GENIE tune all give reasonable agreement

# Result (II): Differential Cross Section

arXiv: 2110.14023



- Differential cross section as a function of:
  - Muon energy: reasonable agreement in shape but differ in normalization for all generators
  - Hadronic energy transfer: GiBUU gives best agreement at low energy transfer

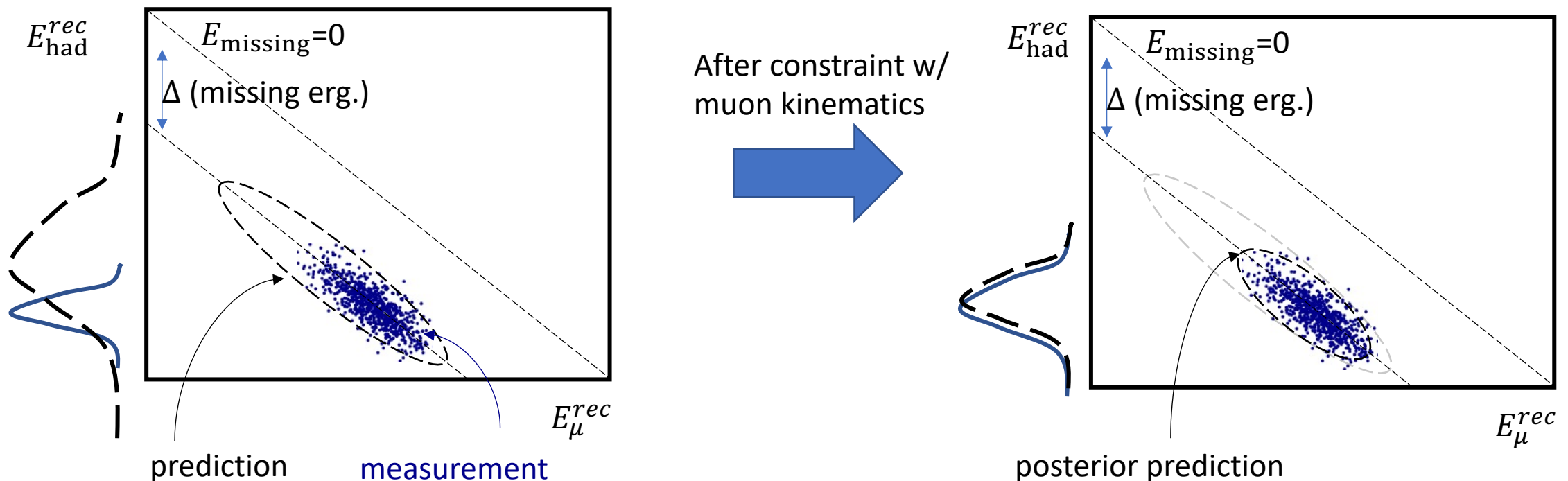
# Summary

- More stringent model validation for hadronic missing energy performed with a formalism of conditional constraint to muon kinematic distributions
  - Enabled by a high-performance inclusive  $\nu_\mu$  CC selection (92% purity, 68% efficiency) using Wire-Cell reconstruction at MicroBooNE
- Differential cross section  $d\sigma/dE_\mu$  and the first-time measurement of  $d\sigma/d\nu$  & total cross section  $\sigma(E)$  on argon are extracted with the Wiener-SVD unfolding procedure
  - **Results are compared with the state-of-the-art prediction: GiBUU agrees the best**
- Ongoing analysis with one order magnitude more data ( $\sim 7E20$  POT) targeting multi-dimensional differential cross sections

# Backup Slides

# Strategy for Further Validating the Hadronic Missing Energy

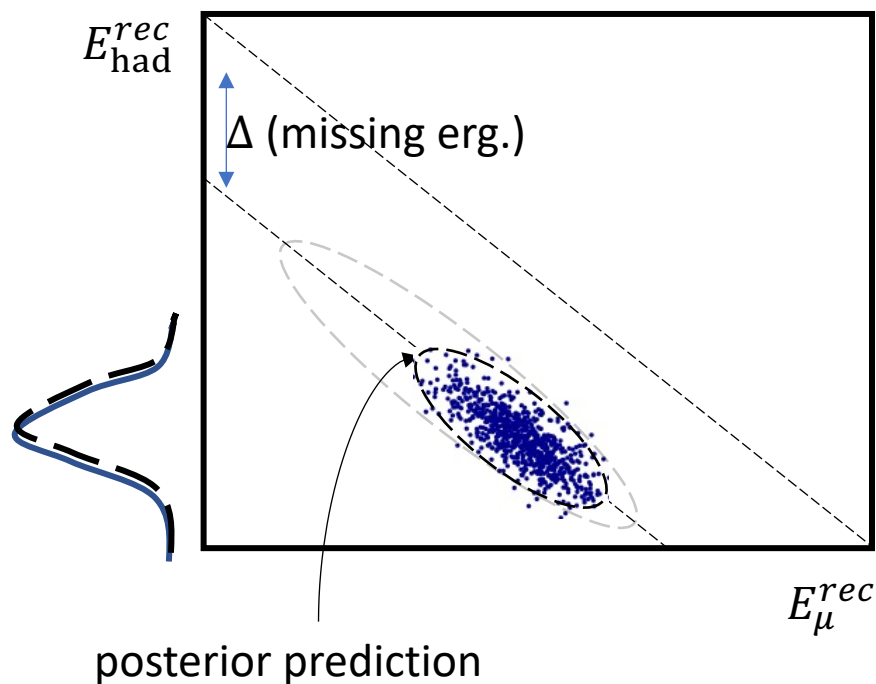
- Consider an idea case: a mono-energetic neutrino beam
- The measured muon energy distribution can adjust the model prediction of hadronic energy and its uncertainty



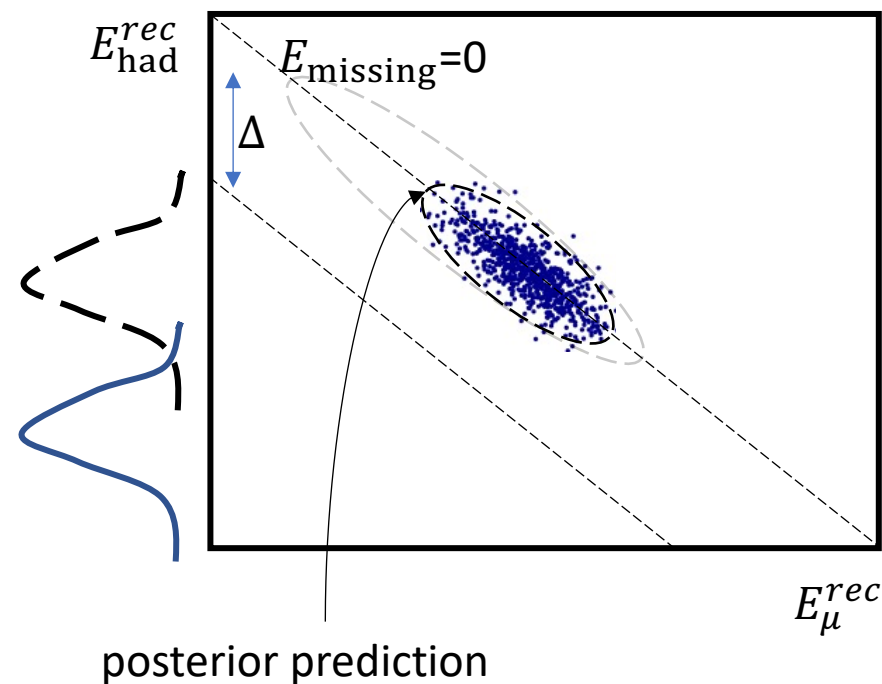
- We do not directly measure missing energy, while the agreement in the measured hadronic energy proves the proper modeling of missing energy



# What if an incorrect modeling of missing energy?



(a) Correct model of missing energy

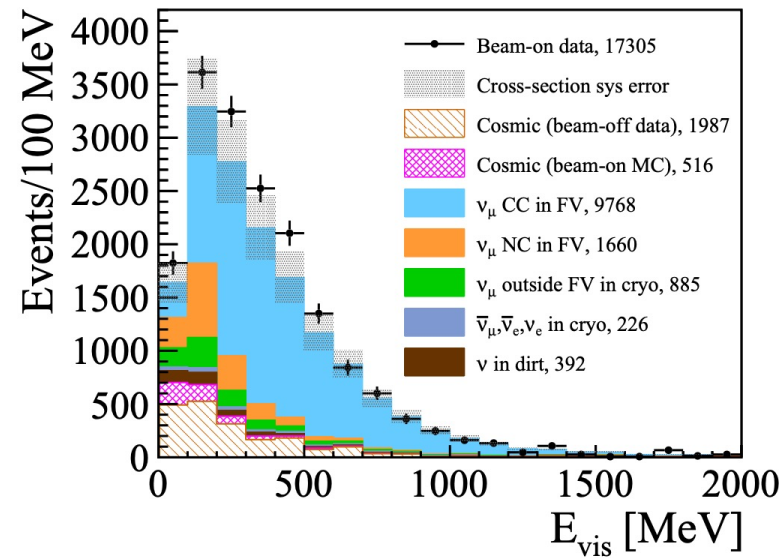
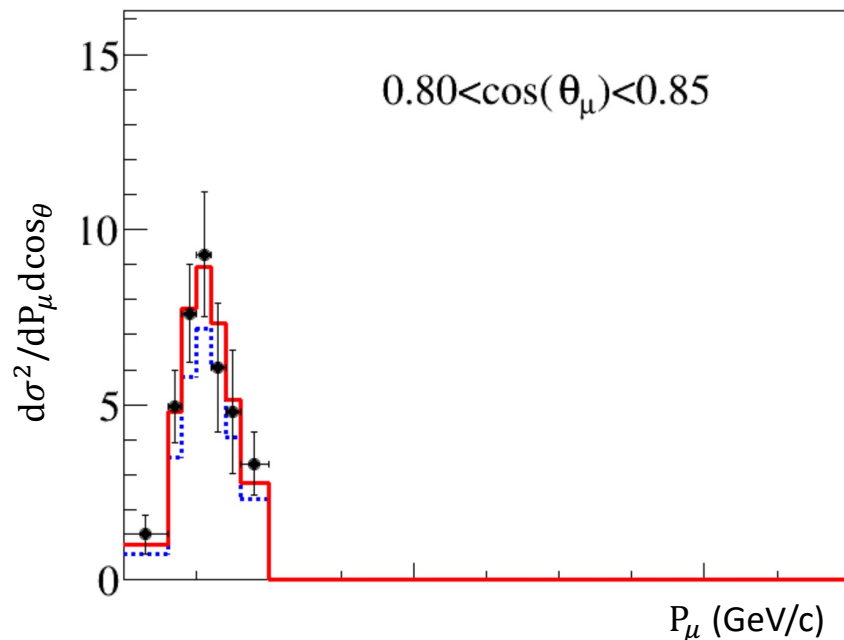


(b) Incorrect model of missing energy

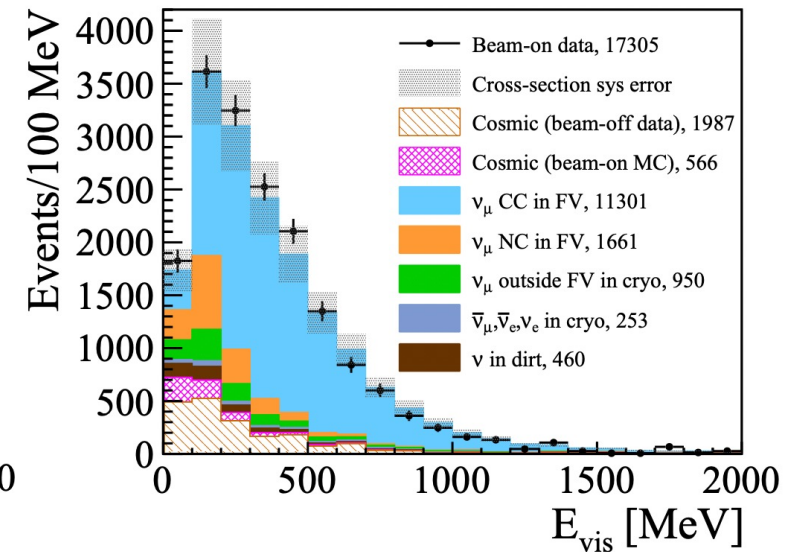
- An incorrect missing energy model cannot give a consistent posterior prediction (after  $E_{\mu}^{rec}$  constraint) of the measured  $E_{had}^{rec}$
- The example here is just for illustration, the actual constraint relies on various kinematic distributions

# MicroBooNE GENIE Tune

- MicroBooNE has recently made significant upgrades to its neutrino interaction model (arxiv: 2110.14028)
  - GENIE v3 based RPA, 2p2h
  - Theory-driven tuning to T2K CC0 $\pi$  data



Before tuning



After Tuning

# Cross Section Extraction

Measurements  $\downarrow$   $\nu_\mu$  Neutrino Flux  $\searrow$   $\nu_\mu$  CC cross section  $\downarrow$  Detector response matrix  $\swarrow$  Selection efficiency  $\swarrow$  Background  $\swarrow$

$$M(E_{rec}) = POT \cdot T \cdot \int F(E_\nu) \cdot \sigma(E_\nu) \cdot D(E_\nu, E_{rec}) \cdot \varepsilon(E_\nu, E_{rec}) \cdot dE_\nu + B(E_{rec})$$

$$M_i = \sum_j R_{ij} \cdot S_j + B_i$$

$$S_j = \frac{\int_j \bar{F}(E_{\nu j}) \cdot \sigma(E_{\nu j}) \cdot dE_{\nu j}}{\int_j \bar{F}(E_{\nu j}) \cdot dE_{\nu j}}$$

Nominal-flux weighted cross section

\* Proper treatment of flux shape uncertainty: PhysRevD.102.113012

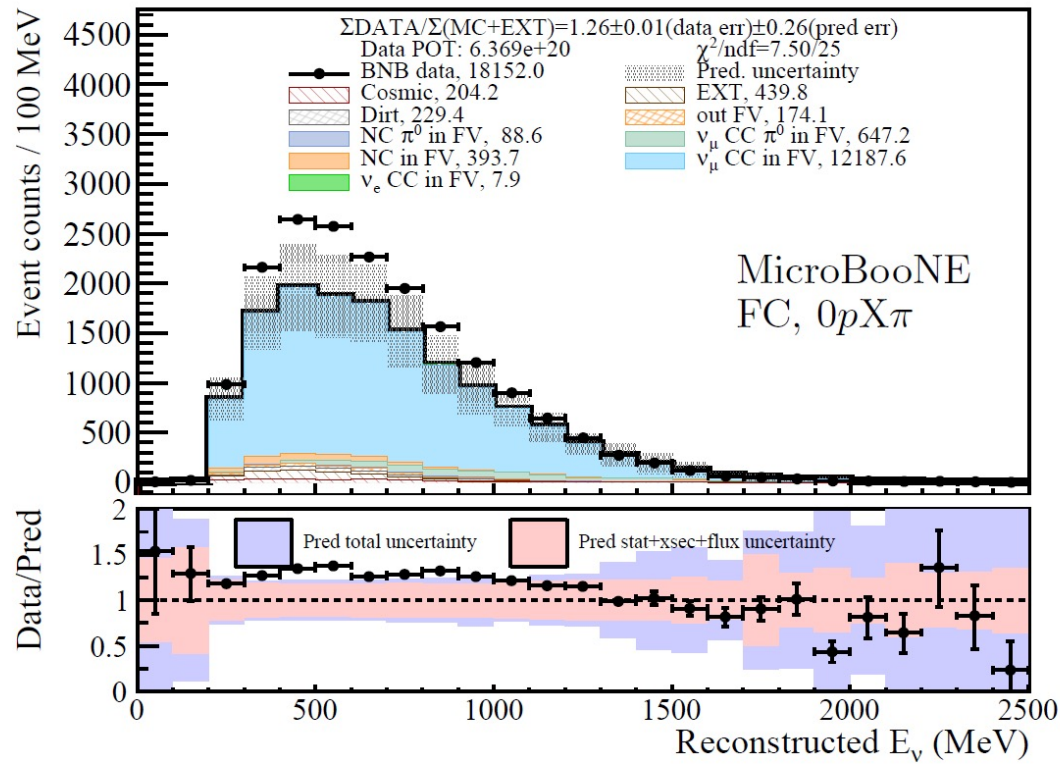
$$R_{ij} = \tilde{\Delta}_{ij} \tilde{F}_j \quad \tilde{F}_j = POT \cdot T \cdot \int_j \bar{F}(E_{\nu j}) \cdot dE_{\nu j}$$

$$\tilde{\Delta}_{ij} = \frac{POT \cdot T \cdot \int_j F(E_{\nu j}) \cdot \sigma(E_{\nu j}) \cdot D(E_{\nu j}, E_{rec i}) \cdot \varepsilon(E_{\nu j}, E_{rec i}) \cdot dE_{\nu j}}{POT \cdot T \cdot \int_j \bar{F}(E_{\nu j}) \cdot \sigma(E_{\nu j}) \cdot dE_{\nu j}}$$

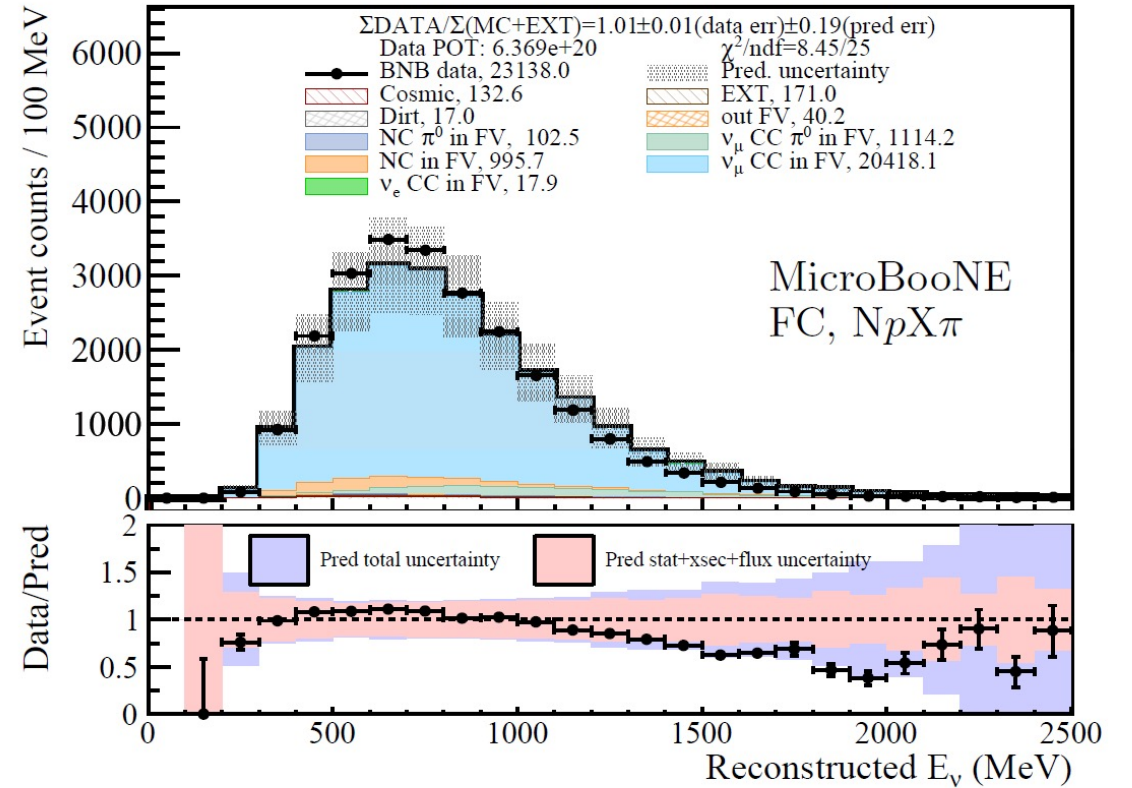
$i$ : bin in  $E_{rec}$      $j$ : bin in  $E_\nu$

MicroBooNE's nominal MC (GENIE v3 tune) is used to determine  $R_{ij}$

# 0p/Np separation in $\nu_\mu$ CC

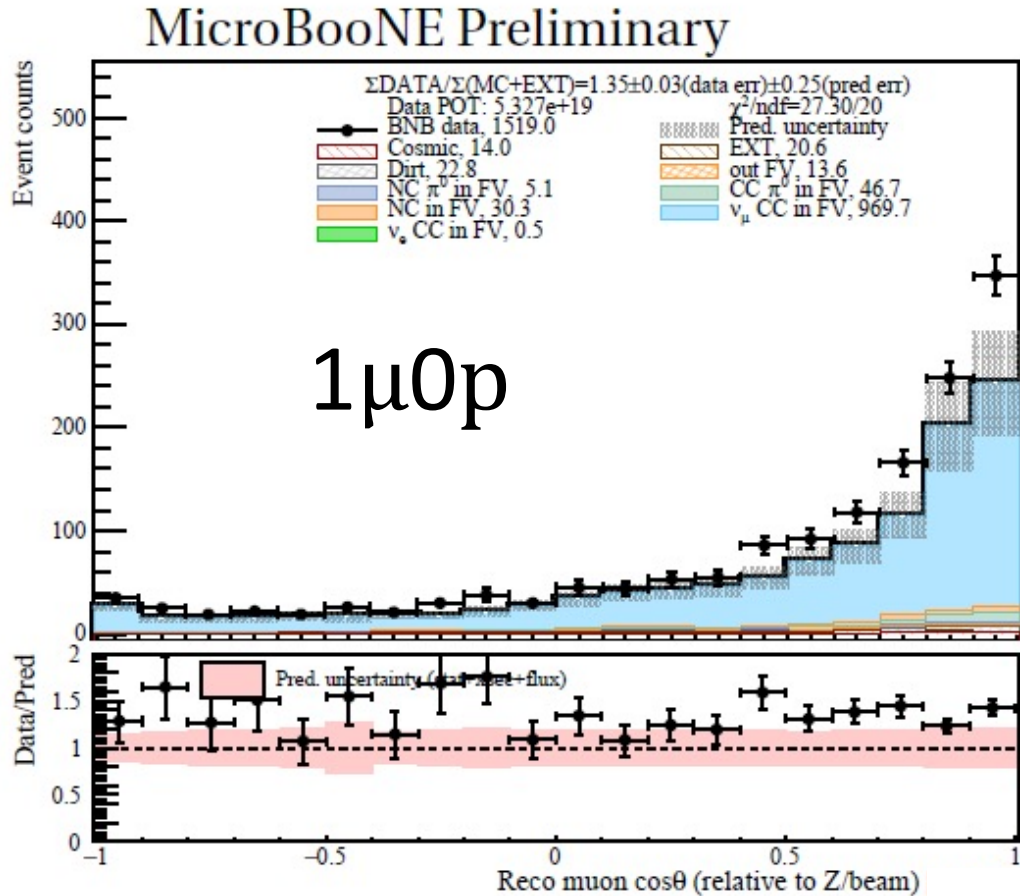


(a) FC  $\nu_\mu$  CC,  $0pX\pi$

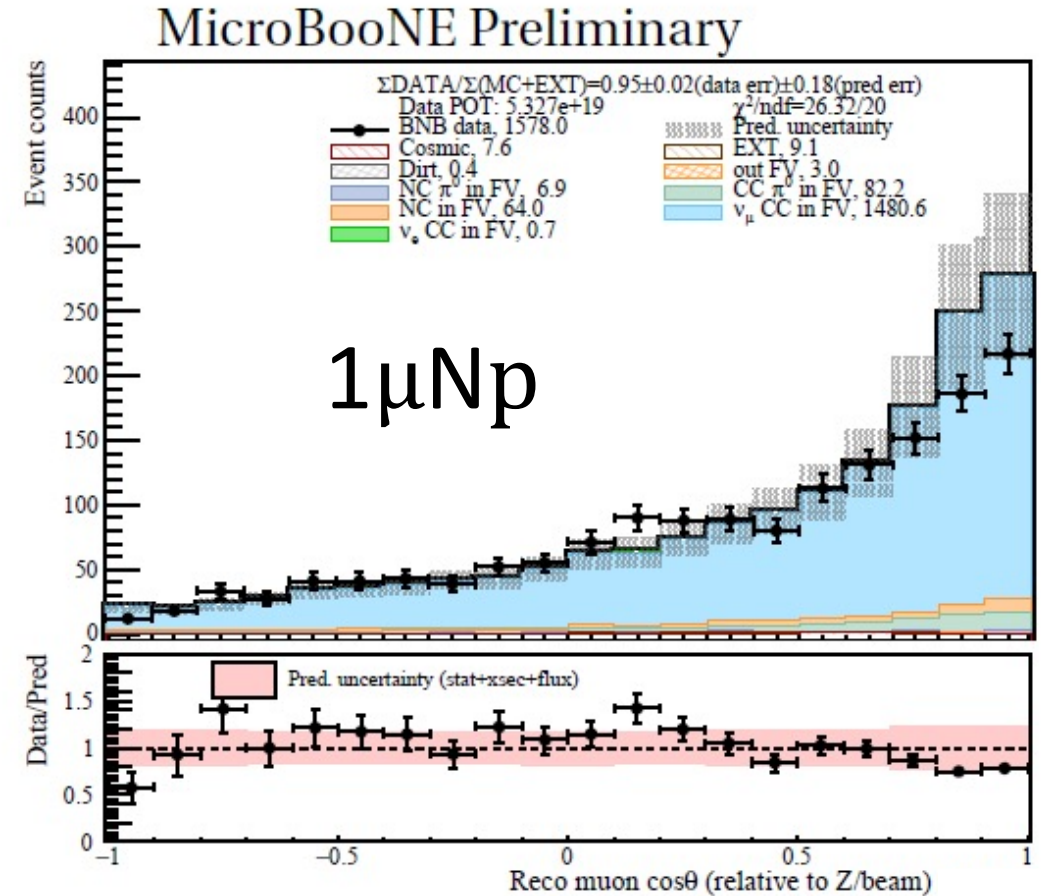


(c) FC  $\nu_\mu$  CC,  $NpX\pi$

# Model Comparison in High Dimension



Overall excess

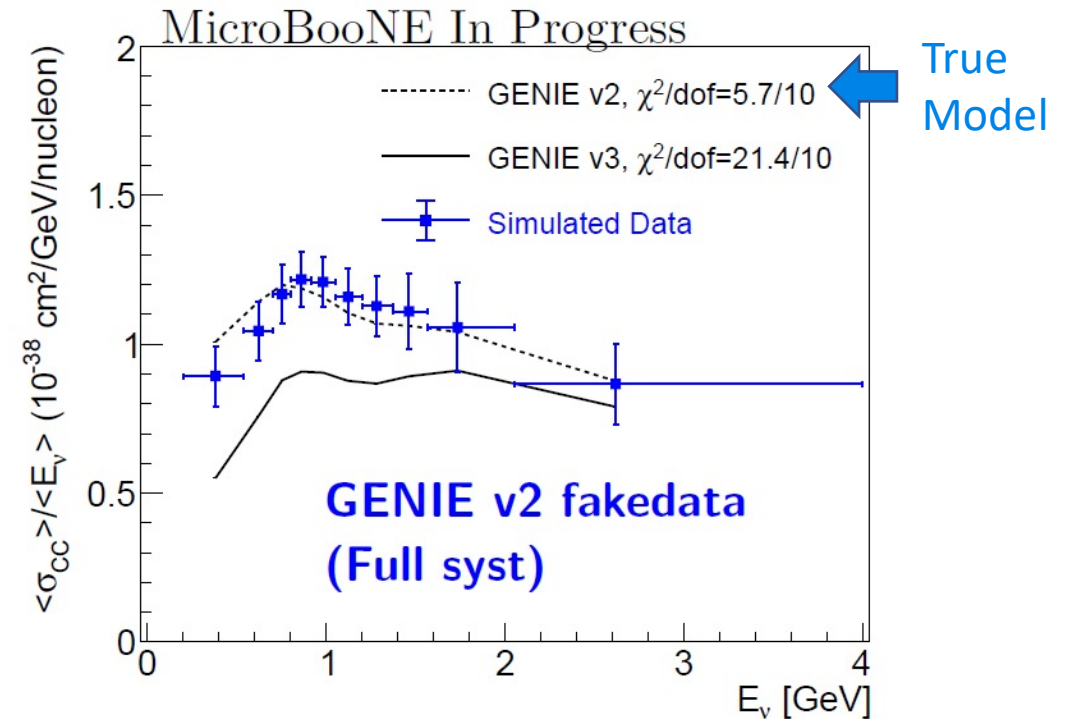
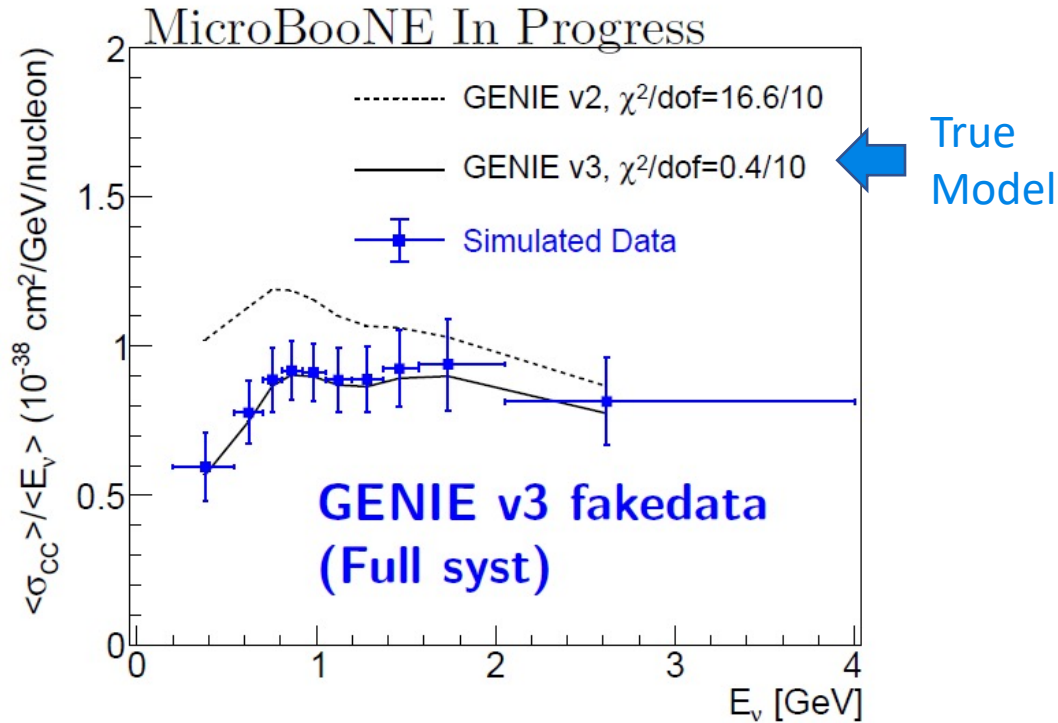


Deficit at muon forward angle

- High-statistics  $\nu_\mu$  CC allows for multi-dimensional cross-section measurements

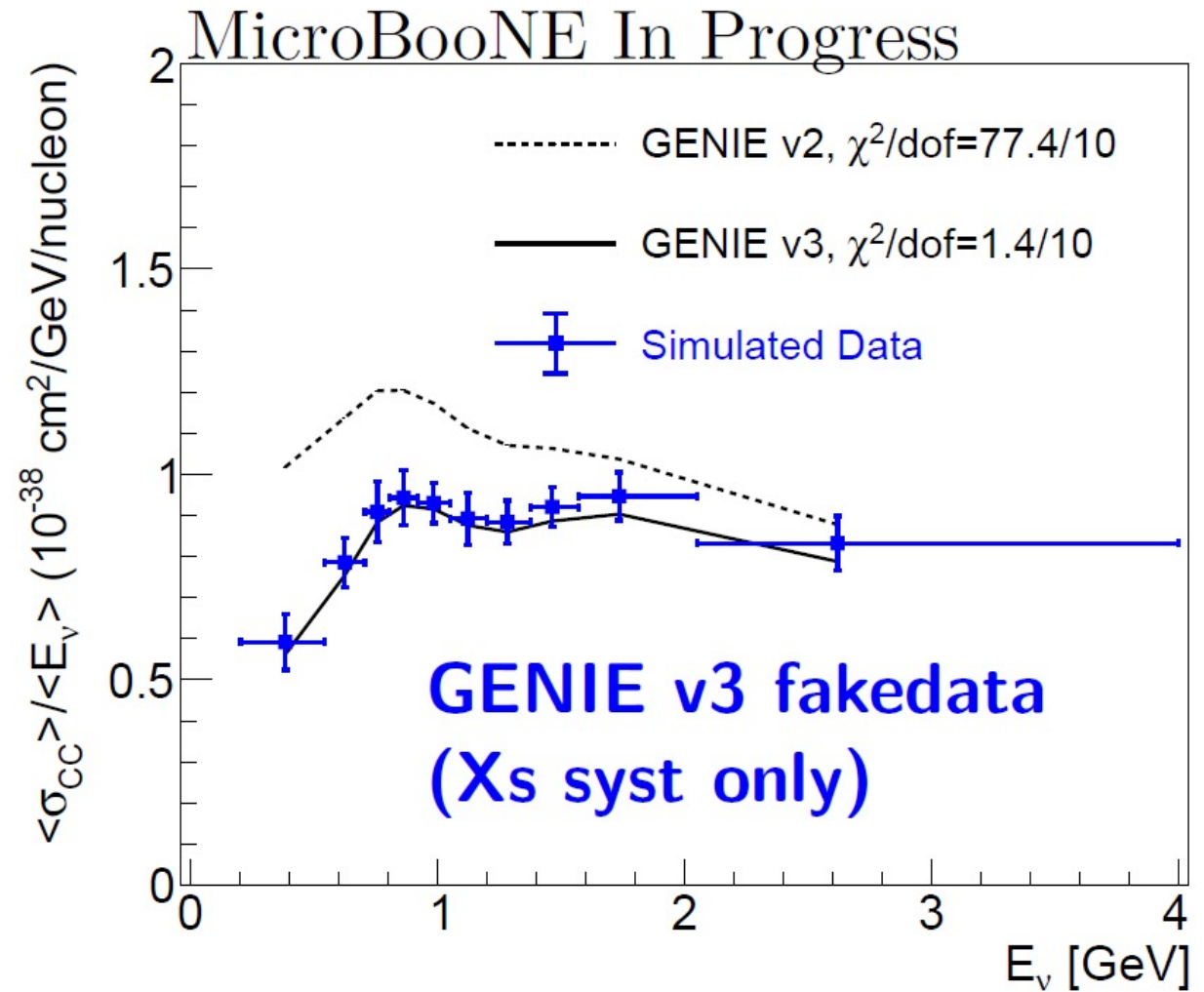
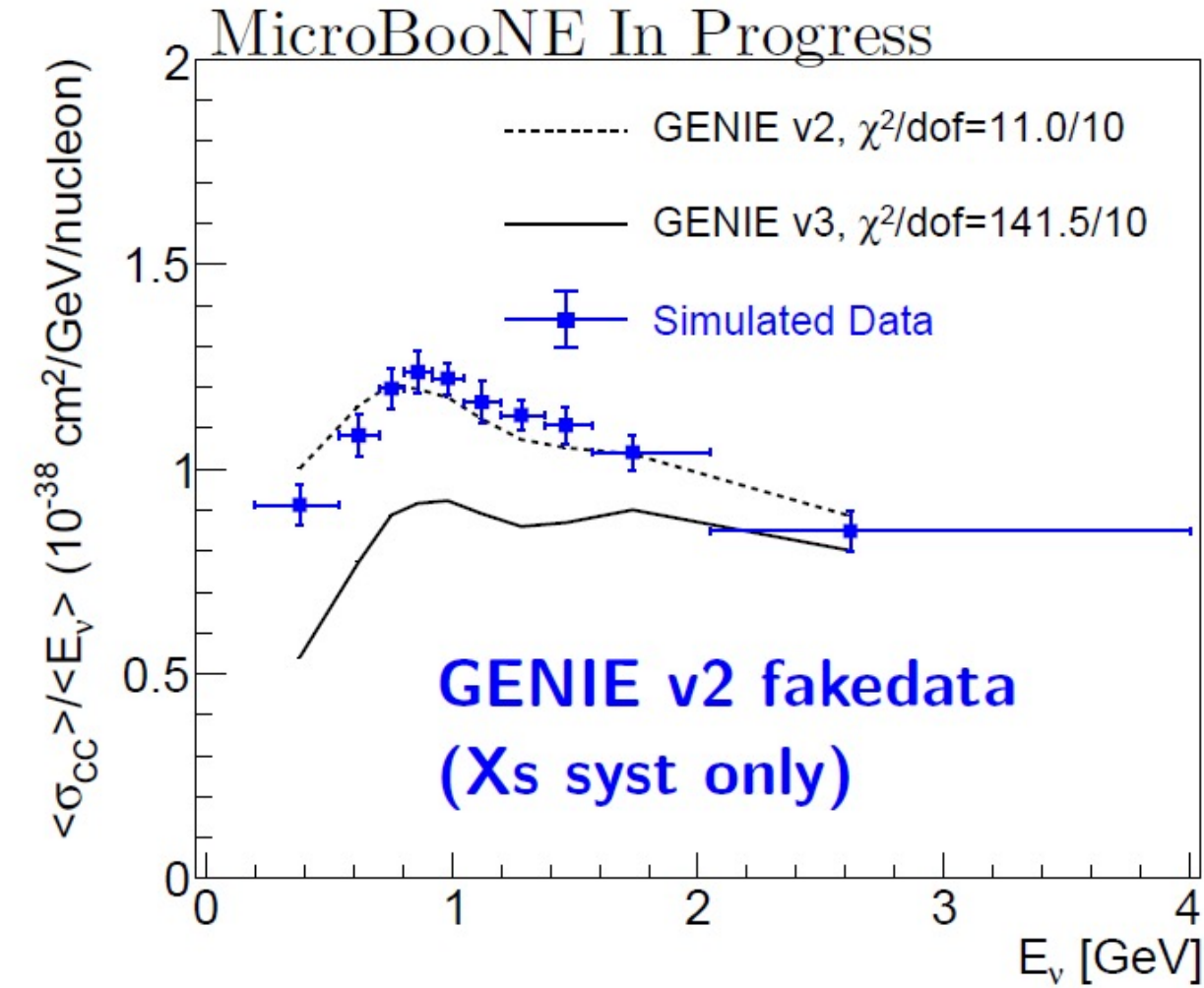


# Procedure Validation with Simulated Data



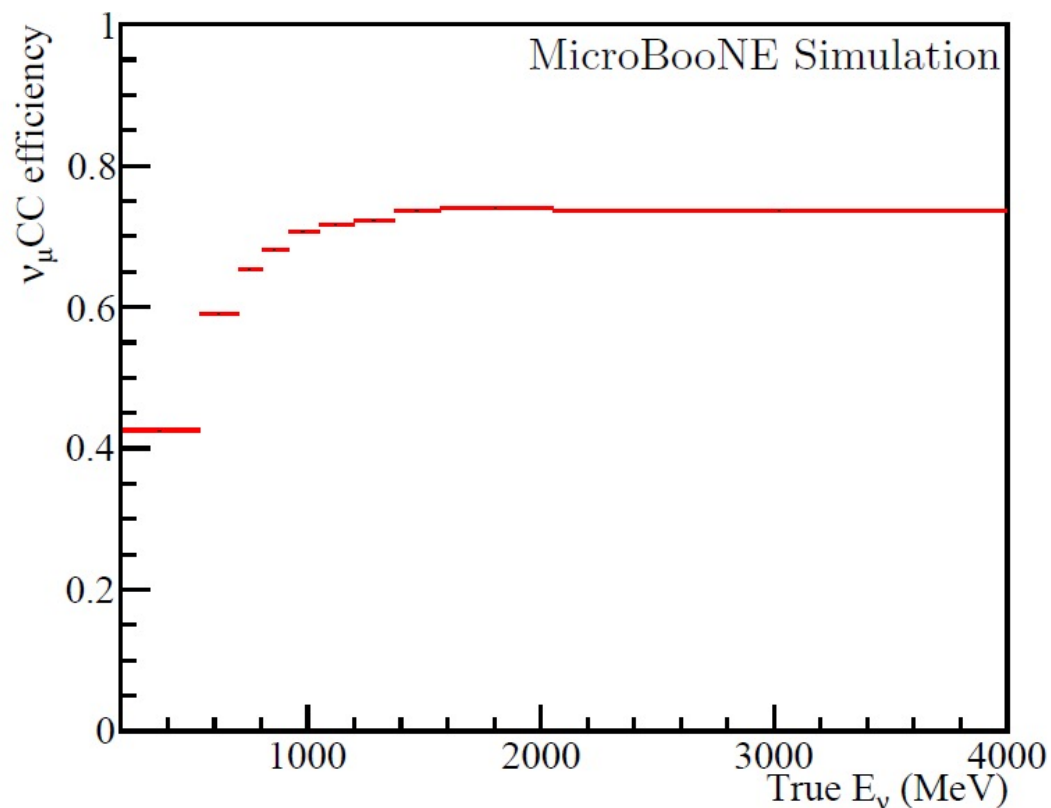
- MicroBooNE's nominal MC is used to extract the cross section from the “fake dataset” – same treatment as data
- Analyses of cross-section extraction from two simulated data sets justify the unfolding procedure

# Validation with Simulated Data



# $\nu_\mu$ CC and $\nu_e$ CC Event Selection

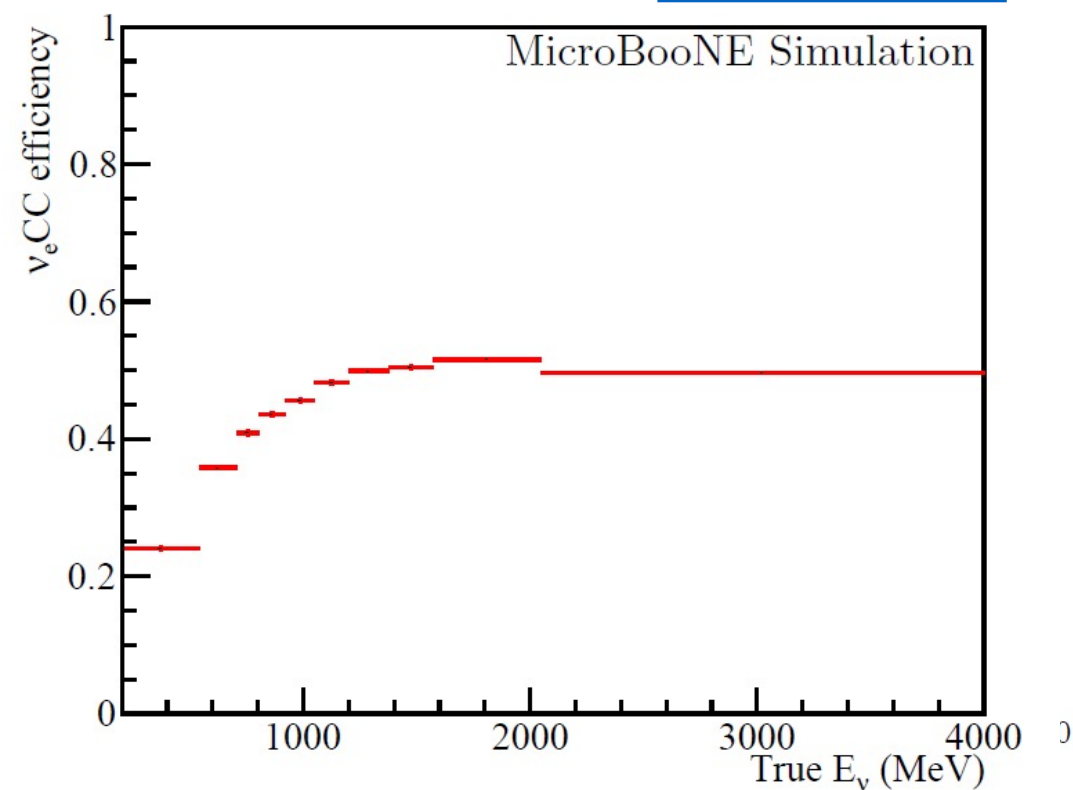
[arXiv:2110.13978](https://arxiv.org/abs/2110.13978)



Efficiency: 68%

w.r.t to all  $\nu_\mu$ CC w. vertex in fiducial volume

Purity: 92% (>5 improvement)



Efficiency: 46%

w.r.t to all  $\nu_e$ CC w. vertex in fiducial volume

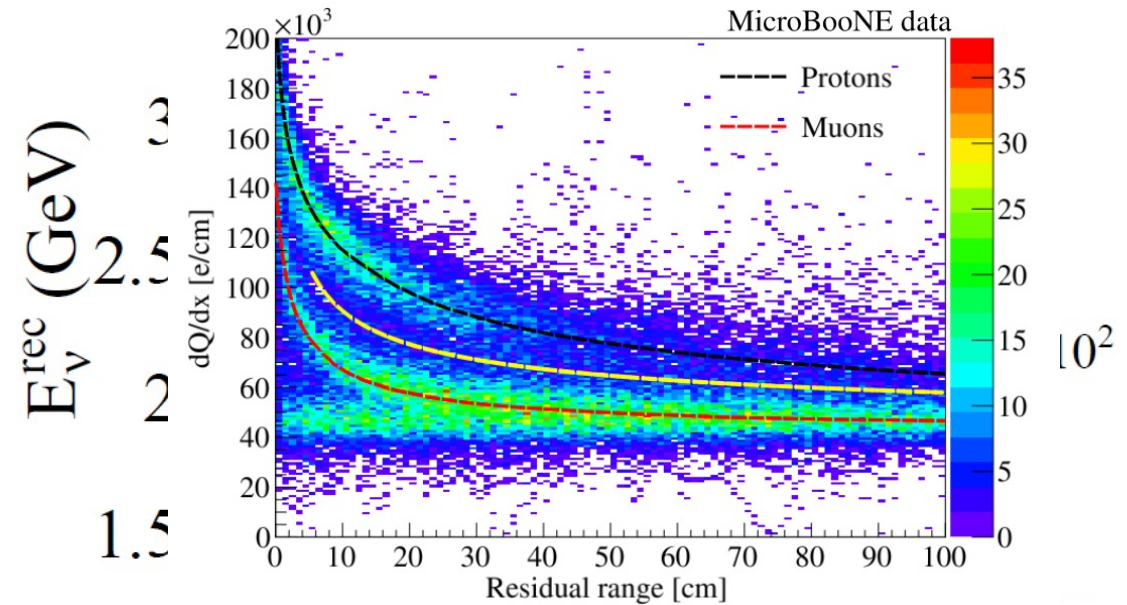
Purity: 82% (>800 improvement)

As a near-surface detector, performance close to DUNE's requirement in a wide energy range

# Neutrino Energy Reconstruction

- Calorimetry energy reconstruction with particle mass and binding energy included if PID can be done

- Track: Range,  $dQ/dx \rightarrow dE/dx$  correction
  - Calibrated by stopped muons/protons
- EM shower: scaling of charge
  - Calibrated by  $\pi^0$  invariance mass



- Fully contained events

$\nu_e CC$  10-15% resolution ~7% bias  
 $\nu_\mu CC$  15-20% resolution ~10% bias

